Èdouard Lucas:

The theory of recurrent sequences is an inexhaustible mine which contains all the properties of numbers; by calculating the successive terms of such sequences, decomposing them into their prime factors and seeking out by experimentation the laws of appearance and reproduction of the prime numbers, one can advance in a systematic manner the study of the properties of numbers and their application to all branches of mathematics.







Multiresolution Redistricting

Daryl DeFord

MIT – CSAIL Geometric Data Processing Group

Quantitative Investigations of Gerrymandering and Redistricting Duke University Durham, NC March 2, 2020



Outline

1 Introduction

2 Ensembles in Maptitude

3 Multiresolution Data

Network Properties Ensemble Comparisons Urban vs. Rural

Ounty Preservation Rules

Optimization Virginia Pennsylvania



MORAL #1:



MORAL #1:

Computational Redistricting is NOT a solved problem!

2



MORAL #2:



MORAL #2:

Computational Redistricting is NOT a solved problem!



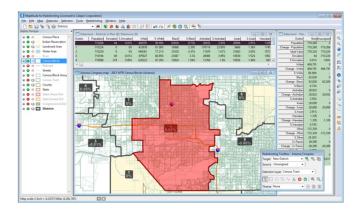
MORAL #2:

Computational Redistricting is NOT a solved problem!





Ensembles in Maptitude





Potential Input Categories

- Report styles and outputs
- Methodology
- Metrics to evaluate
- Data decisions
- Communication



Target Audiences (and framework)

- Consultants
- Commissions/Legislators
- Public outreach
- Researchers



Target Audiences (and framework)

- Consultants
- Commissions/Legislators
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Current Structure:

- Build a map
- 2 Push a button
- 6 Get a report



Possible Outputs

- Binary (p-value?)
- Distribution of summary statistics:
 - Full ensemble
 - Extreme values
 - Variants with similar properties
- Example plans:
 - Full Assignment Files
 - Filtered subsets
 - Nearby alternatives



Methodology and Implementation

- Markov chains at all?
- Target Distributions
- Sampling Techniques
- Constraints and Parameters
- Underlying Data



Methodology and Implementation

- Markov chains at all?
- Target Distributions
- Sampling Techniques
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Alternative Workflows:

- Local optimization/comparison
- Iterative design process
- Generate and smooth



What to measure?

- Compactness scores
- Partisan Statistics
- VRA "compliance"



What to measure?

- Compactness scores
- Partisan Statistics
- VRA "compliance"

Then what?

- Optimization
- Interactions and Tradeoffs
- Normative Concerns
- Meaningfulness



Landscape Impact

• (caveat) Proprietary Methodology

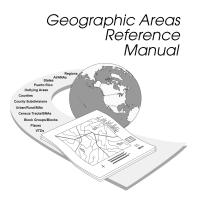


Landscape Impact

- (caveat) Proprietary Methodology
- How does this impact priorities for analysis?
- How might this change consensuses around ensembles work?
- ... • ... • ...



Census Data



Documentation: https://www2.census.gov/geo/pdfs/reference/GARM/ Data: daryldeford.com/dual_graphs

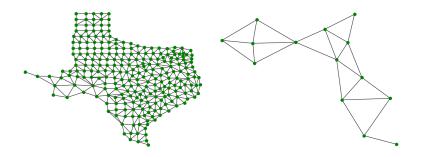


Counties



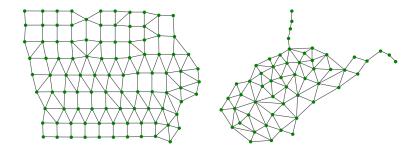


Counties

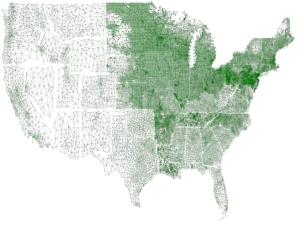




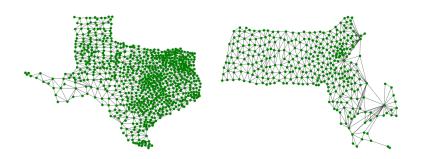
Counties



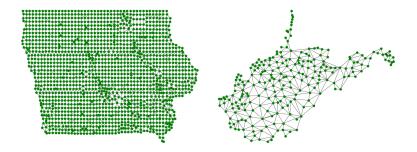










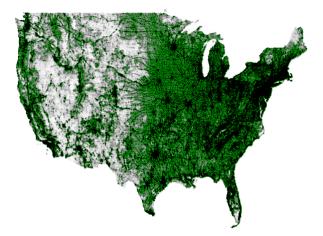






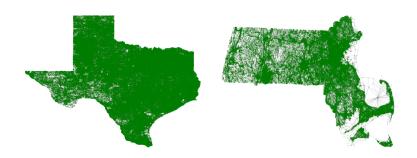






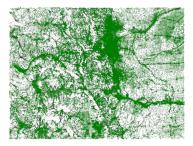


Blocks





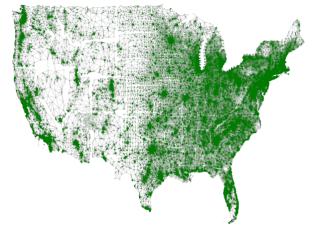






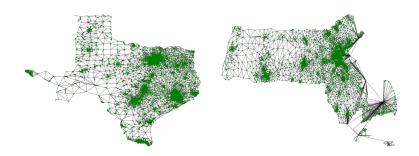


Block Groups



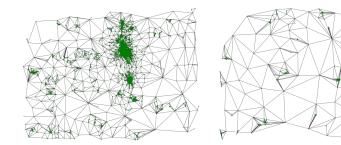


Block Groups



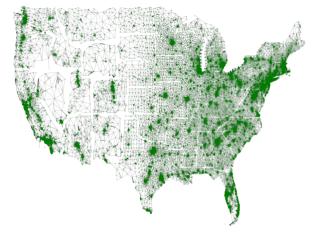


Block Groups



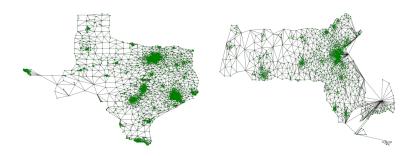


Tracts



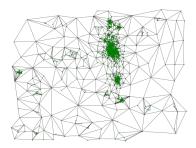


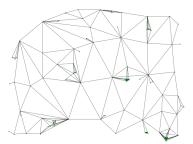
Tracts





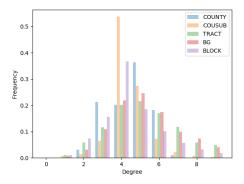
Tracts





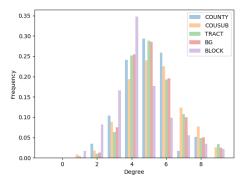


Degree Distributions (lowa)



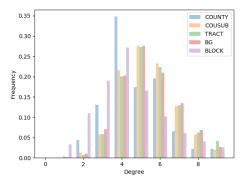


Degree Distributions (California)



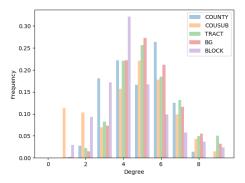


Degree Distributions (South Carolina)



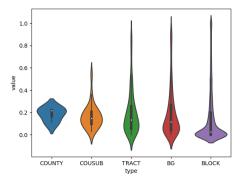


Degree Distributions (Wisconsin)



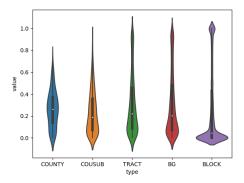


Homogeneity - BVAP - Delaware



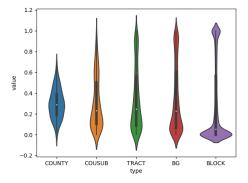


Homogeneity - BVAP - Georgia



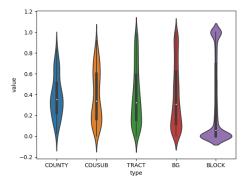


Homogeneity - BVAP - Louisiana



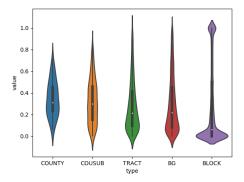


Homogeneity - BVAP - Mississippi



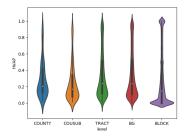


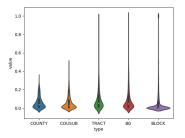
Homogeneity - BVAP - South Carolina





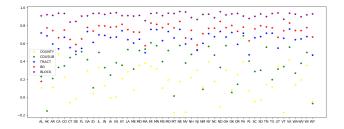
Homogeneity - HVAP - BVAP - Texas





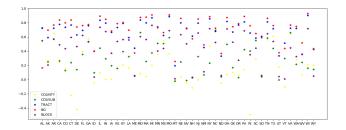


Assortativity (Urban/Rural)



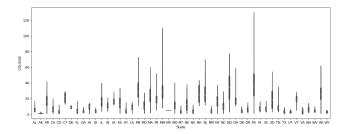


Assortativity (BVAP)



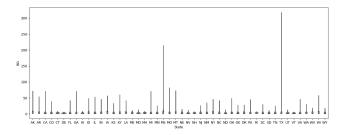






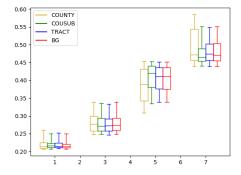






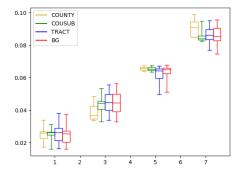


Ensemble Comparisons - BVAP - Mississippi



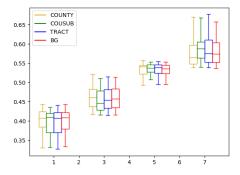


Ensemble Comparisons - BVAP - Kansas



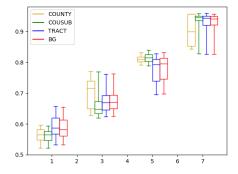


Ensemble Comparisons - Urban/Rural - Mississippi



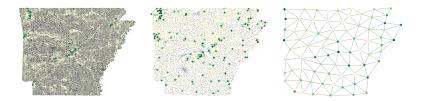


Ensemble Comparisons - Urban/Rural - Kansas





Census Rules

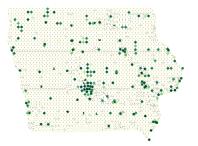


- Defined by population density and total population in contiguous collections of block groups
- Distinguishes between "hop" and "jump" closeness
- Full Guidelines: https: //www2.census.gov/geo/pdfs/reference/fedreg/ua_2k.pdf



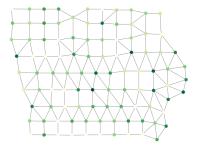


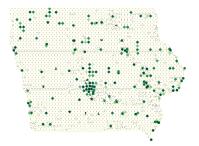






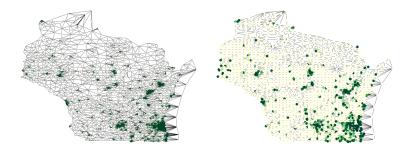
Examples





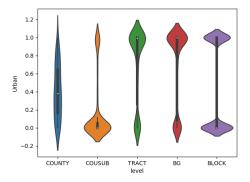








Homogeneity





Algorithmic Approaches

- Definitely Cheating:
 - Geographic/Geometric Data
 - Population or other demographic data



Algorithmic Approaches

- Definitely Cheating:
 - Geographic/Geometric Data
 - Population or other demographic data
- Partially Cheating:
 - Provide some set of initial labels (Belief Propagation)
 - Multiresolution (use nesting properties)



Algorithmic Approaches

- Definitely Cheating:
 - Geographic/Geometric Data
 - Population or other demographic data
- Partially Cheating:
 - Provide some set of initial labels (Belief Propagation)
 - Multiresolution (use nesting properties)
- Not cheating:
 - Extracting grid subgraphs
 - Centrality measures



Rules and Modeling

County Preservation

- Minimize to the extent possible
- Splitting bounds by county
- County Cluster



Rules and Modeling

County Preservation

- Minimize to the extent possible
- Splitting bounds by county
- County Cluster

How to implement:

- Multi-resolution dual graphs
- Hierarchical Clustering
- Proposal Optimization
- Markov chains with marked edges



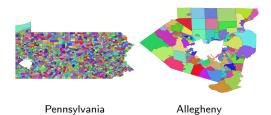






Multiresolution Redistricting County Preservation Rules

Municipalities





Precincts





Multiresolution Redistricting County Preservation Rules

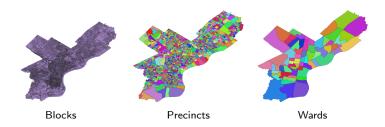
Putting Them Together





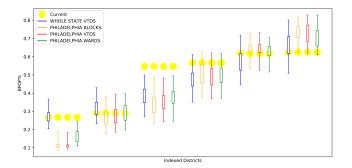
Multiresolution Redistricting County Preservation Rules

Putting Them Together





Comparison of BPOP Districts





Building Seeds

- County Splits
- VRA compliance
- Partisan Metrics
- Population Balance



Building Seeds

- County Splits
- VRA compliance
- Partisan Metrics
- Population Balance

- "Coerce" with acceptance functions
 - Bound kth district changes
 - Ladder methods
- Local Hill Climbing
- Proposal Tuning



Weighted Trees

- At each step of the ReCom chain weight the edges of the dual graph by a random function of county similarity
- Draw a maximal spanning tree
- Cut like normal



Weighted Trees

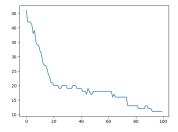
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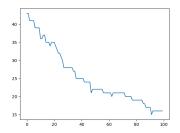
Intuition

- In the limit, equivalent to drawing a spanning tree for each county and then a spanning tree on the county dual graph
- Imagine starting in one corner of the graph and following the tree through the counties
- The population constraint still requires some counties to be split



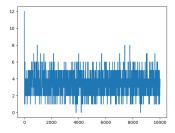
Virginia - Pennsylvania

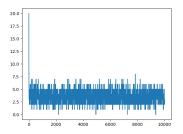






Kansas - Block Groups - County Subunits





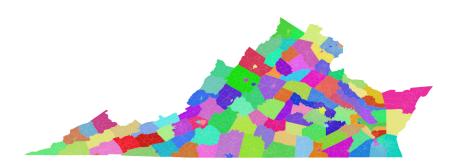






Multiresolution Redistricting County Preservation Rules Virginia

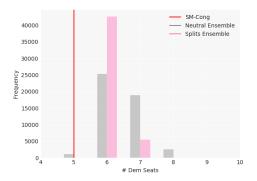
Virginia Localities





Multiresolution Redistricting County Preservation Rules Virginia

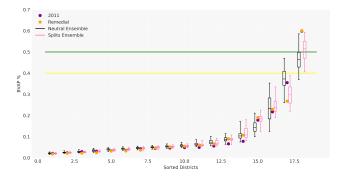
Partisan Impacts





Multiresolution Redistricting County Preservation Rules Pennsylvania

Mixed Evidence





Multiresolution Redistricting County Preservation Rules Pennsylvania



$Thanks!^1$



 $^1 \text{Computational Redistricting is not a solved problem! } \odot$